Pebble Games and Complexity

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- Input: circuit C instance
 - instance x



- Input:
 - circuit C
 - instance x
- Output: Result of evaluating C on x

Complete for P

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- "Complete" for NC^{*i*} for restricted C of depth $\leq O(\log^i n)$

Complete for P

$$\mathsf{NC}^i =$$
 size $n^{O(1)}$, depth $O(\log^i n)$

Complete for P

$$\begin{split} \mathsf{NC}^{i} &= & \mathsf{size} \ n^{O(1)}, & \mathsf{depth} \ O(\log^{i} n) \\ &\approx & \mathsf{processors} \ n^{O(1)}, & \mathsf{parallel time} \ O(\log^{i} n) \end{split}$$

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- Concerns space and parallel complexity
- Applications: Database query algorithms, Data flow models, Big Data computation, etc.



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[Hopcroft-Paul-Valiant '77]

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$\mathsf{NC}^1 \subset \mathsf{L} \subset \mathsf{NL} \subset \mathsf{NC}^2 \subset \mathsf{NC}^3 \subset \cdots \subset \mathsf{NC} \subset \mathsf{P}$

 $m-NC^1 \subsetneq m-NL$ m-circuits

[Karchmer–Wigderson '90]

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Theorem ([c. '13])

 $\forall G$ Simulation of strategies among Raz-McKenzie game, reversible game, and Dymond-Tompa game.

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In the bounds for Iterated indexing:

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NC^1 vs NC^2	Universal composition relation	[Edmonds–Impagliazzo–Rudich–Sgall '01] [Gavinsky–Meir–Weinstein–Wigderson '13
${\sf NC}^1$ vs ${\sf NC}^2$	Universal composition relation	[Håstad–Wigderson '97]
NC ⁱ vs NC ⁱ⁺¹ NC vs P	Iterated indexing	[C. '13]

In the bounds for Iterated indexing:

- Upper bound by Dymond–Tompa game
- Lower bound by Raz–McKenzie game

- Parallel Complexity
- Space Complexity
- Randomised Complexity
- Communication Complexity
- Decision Tree Complexity (Certificate Complexity)
- Proof Complexity
- Algebraic Complexity

Reversible game Dymond–Tompa game Raz-McKenzie game

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Irreversible Program Reversible Program

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- Monotone space lower bounds [Potechin '10] [C.-Potechin '12]:
 - Determinism equals reversibility/symmetry [Lange-McKenzie-Tapp '00] [Reingold '08]

Dymond–Tompa Pebble Game

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Capture complexity classes and inclusions [Venkateswaran-Tompa '89]

- ▶ (#Pebble used) characterizes parallelism in NCⁱ, NC, P, etc;
- Simulates the inclusion of $NL \subseteq NC^2$.

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- 4. Combine the results in Step 2 in constant time














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 - **Pebbler** chooses a node to pebble
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- Alternate to move, Pebbler moves first
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- Each round:
 - Pebbler chooses a node to pebble
 - Challenger chooses to stay or jump
- Pebbler wins if, before she moves, the challenged node has all immediate predecessors pebbled
- Challenger aims to delay the inevitable



► Give depth lower bounds to monotone circuits [Raz-McKenzie '99]

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Applications to Proof Complexity:

Inspired pebbling contradictions (next slide)

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Applications to Proof Complexity:

- Inspired pebbling contradictions (next slide)
- Separation and Trade-off Results:
 - Cutting plane refutations [Bonet-Esteban-Galesi-Galesi '98]
 - Treelike resolution refutations [Ben-Sasson-Impagliazzo-Wigderson '04] [Urquhart '11]
 - Regular resolution refutations [Alekhnovich–Johannsen–Pitassi–Urquhart '07]
 - Clause learning algorithms [Beame-Impagliazzo-Pitassi-Segerlind '10]
 - Nullstellenzatz and Polynomial Calculus

[Buresh-Oppenheim-Clegg-Impagliazzo-Pitassi '02]

k-DNF resolution refutation [Esteban-Galesi-Messner '04]

 Give depth lower bounds to monotone circuits [Raz-McKenzie '99] Motivated by decision tree complexity of search problems

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- k-DNF resolution refutation [Esteban-Galesi-Messner '04]
- Depth of resolution refutation [C. '13]

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Implication Truth propagates through the graph,



- Given G, construct an unsatisfiable CNF Σ_G :
- One variable per node
- Add the following clauses:

Source All source variables are TRUE,

Implication Truth propagates through the graph,

Sink The sink variable is false.

Resolution refutation of minimum depth for Σ_G .

Resolution Step:
$$\frac{A \lor x \quad B \lor \bar{x}}{A \lor B}$$

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Resolution Refutation

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- Add an initial set-up to make it more like Dymond–Tompa game.

- Two players: Pebbler and Colourer, competitive
- Alternate to move, Pebbler moves first
- Initial Set-up:
 - Pebbler pebbles sink
 - ► Colourer colours sink FALSE
- Each round:
 - Pebbler chooses a node to pebble
 - Colourer chooses to colour it TRUE or FALSE
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Dymond–Tompa pebble game

- Two players: Pebbler and Challenger, competitive
- Alternate to move, **Pebbler** moves first
- Initial Set-up:
 - Pebbler pebbles sink
 - Challenger challenges sink
- Each round:
 - Pebbler chooses a node to pebble
 - Challenger chooses to stay or jump
- Pebbler wins if, before she moves, the challenged node has all immediate predecessors pebbled
- Challenger aims to delay the inevitable

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- When Dymond–Tompa game is over:
 - c is pebbled,
 - all immediate predecessors of c are pebbled,

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 - Proof: by induction.
- When Dymond–Tompa game is over:
 - ▶ *c* is pebbled (FALSE),
 - ▶ all immediate predecessors of *c* are pebbled (TRUE),
 - Raz–McKenzie game is over.

Summary of Results

- Equivalence of Pebble Games
 - Reversible Pebble Game
 - Dymond–Tompa Pebble Game
 - Raz–McKenzie Pebble Game
- Equivalence of Pebble Games
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- Relations to Computational Complexity
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- Applications to Proof Complexity
 - Depth of resolution refutations
 - Size of Tree-Like resolution refutations
- Complexity of Pebble Games
 - PSPACE-complete (bounded fan-in)

Lower Bounds by Communication Complexity Multi-party pointer jumping

[Chakrabarti '07] [Brody-Chakrabarti '08] [Viola-Wigderson '09]

 $ACC^0 \stackrel{?}{=} P$

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 $NL \stackrel{?}{=} NP$ $NC \stackrel{?}{=} P$

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 $ACC^0 \stackrel{?}{=} P$ [Chakrabarti '07] [Brody-Chakrabarti '08] [Viola-Wigderson '09] Extensions of Karchmer-Wigderson framework $NI \stackrel{?}{=} NP$ [Aaronson-Wigderson '09] $NC \stackrel{?}{=} P$ [Kol-Raz '13] Size and Depth of Circuits $TC^0 \stackrel{?}{=} NC^1$ [Allender-Koucký '10] $NC \stackrel{?}{-} P$

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Questions